

# Cost-efficient broccoli head phenotyping using aerial imagery and SfM-based weakly supervised learning

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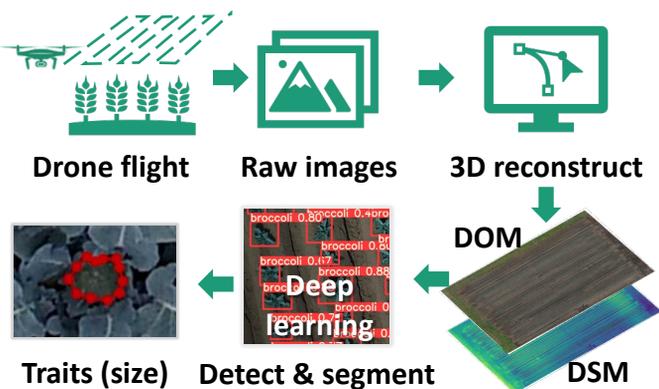


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## Background

### Aerial imagery phenotyping



High throughput & labor-saving

## Challenges

### Low efficiency in data annotation



Huge number of training data need to be labeled manually (2000+)

### High computation cost



Training and applying model is time-costly for common deep learning models

### Low accuracy in traits from DOM

The traits accuracy suffers from low DOM quality



Low resolution

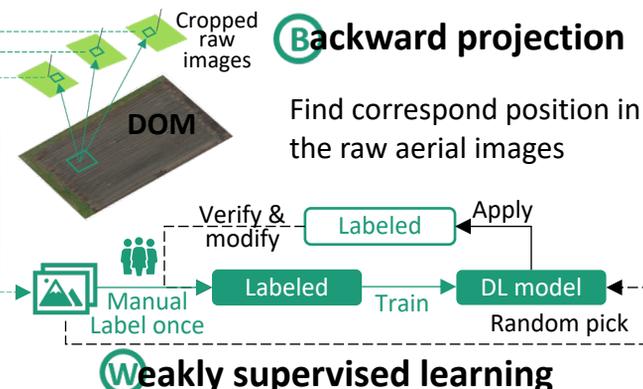


Double mapping

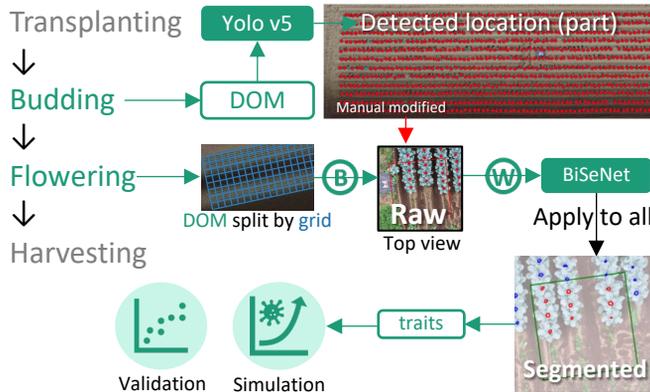


seamline distortion

## Solutions

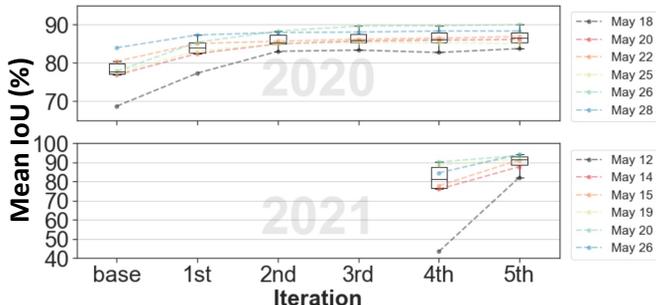


## Workflow



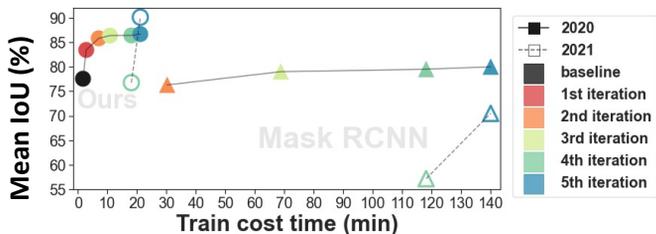
## Results

### Detecting accuracy



Achieve acceptable and migratable model after a few iterations of labor-saving label adjustment (1 hour per iter.)

### Compare to Mask R-CNN



Our method is faster and more accurate

### Measured Traits (part in mm)

label	area	convex_area	eccentricity	major_axis_length	minor_axis_length	perimeter	circularity
1	6059	6647	0.615269	100.735769	79.411777	326.776695	0.713031
2	8860	9663	0.211285	108.662199	106.209088	401.374675	0.691104
3	5777	6408	0.415282	91.251193	83.010534	322.326948	0.698745
				⋮			

## Future work

1. Validate with field measurement
2. Simulate advanced traits (e.g. weight)
3. Predict the best harvest time considering the current market price